



Machine Learning to Drive

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Where are the self-driving cars?



“Self-driving cars are no longer a futuristic AI technology. They’re here” Andrew Ng, May 2018

“Self-driving cars are here!” Waymo 2019



“We will have complete autonomy in approximately two years.” Elon Musk 2015



“When will think it’s safe, full self-driving? Probably toward the end of this year” Elon Musk 2018

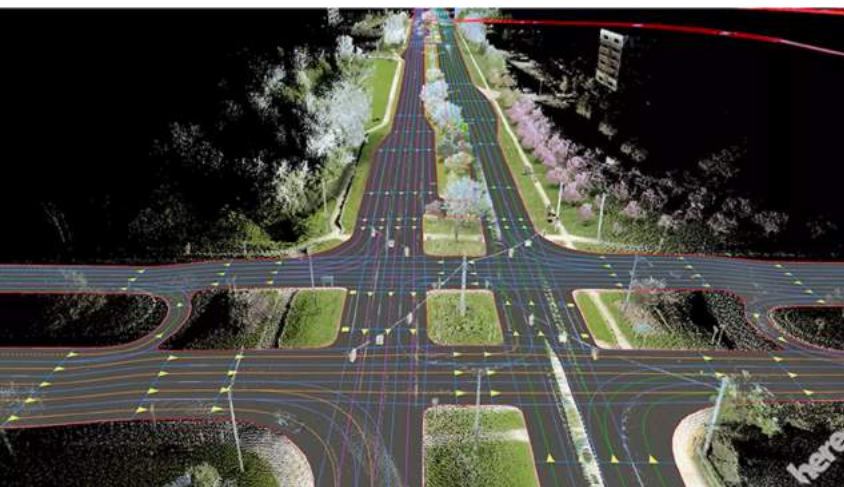


“I think we will be feature complete — full self-driving — this year” Elon Musk 2019









HD Maps

(brittle / slow to build /
expensive to maintain)



LiDAR Sensors

(expensive / short lifespan)

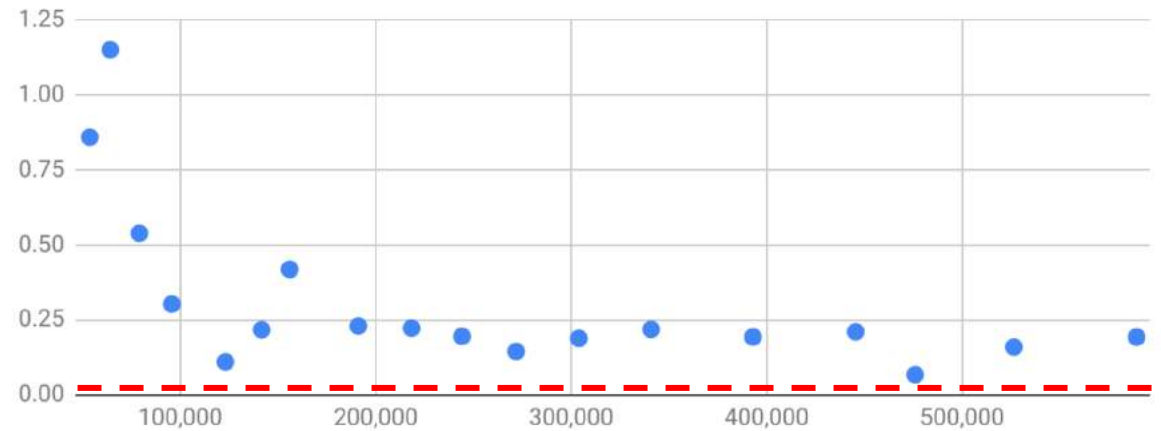


Hand-Designed Rules

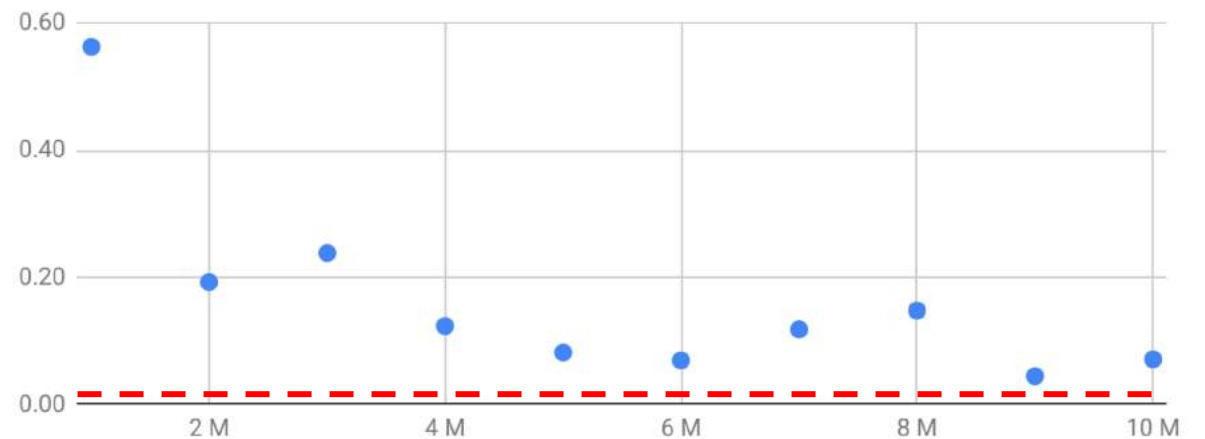
(rigid / clunky)

Performance is saturating no matter how many engineers and resources are thrown at the problem

GM / Cruise Disengagement Rates vs. Total Miles



Waymo Disengagements Rates vs. Total Miles



Human Performance
(0.006 crashes per 1,000 miles)

California DMV Disengagement Reports 2014 - 2019

We have a different approach:

End-to-end deep learning

End-to-end deep learning is winning everywhere



Image recognition, text-to-speech, complex game agents, question + answering....

All are dominated by deep neural networks

Urban driving with end-to-end machine learning

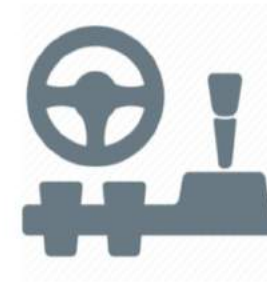


Inputs: camera video and a sat-nav

End-to-end deep learning



Uncertainty propagation
from *sensing* to *action*



Outputs: driving commands

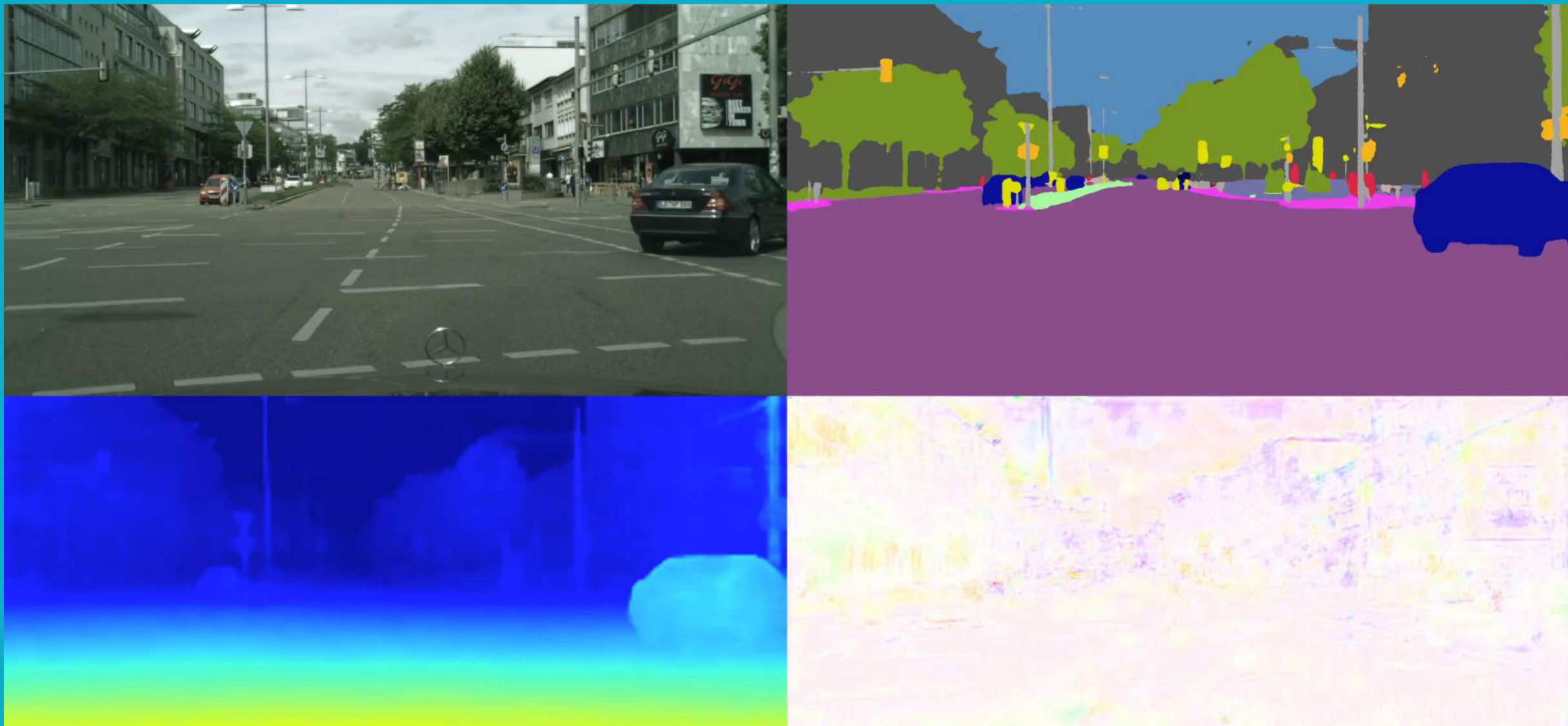








SegNet, University of Cambridge, 2015



Multi-Task Scene Understanding, Wayve, 2018





Machine Learning

- Low engineering effort to create demo
- Brittle representation
- No performance guarantees

- Excels with increasing data and scale
- Can learn powerful representations which generalise
- Validate with statistical evidence

Human Design

- Possible to enumerate all scenarios
- Analytical safety guarantees
- Limited complexity

- Unachievable to identify all edge-cases
- Too complex for safety guarantees
- Requires extremely large engineering effort

Constrained Setting

Big Data

A complete paradigm shift for AVs

- Low vehicle compute and sensor requirements
- Large training compute and data requirements
- Increased vehicle intelligence
- No reliance on HD-maps
- Ability to leverage simulation for training
- Lean and elite engineering team

Come work with our team wayve.ai/careers

